

Lecture 15

Plan

- 1) Finish min T-odd cut
(see Lec14 notes) ✓
- 2) Matroids.

- Pset 4 deadline extended *to Mon Apr 25
- No OH upcoming Monday evening

Matroids

"Tractable" set systems.

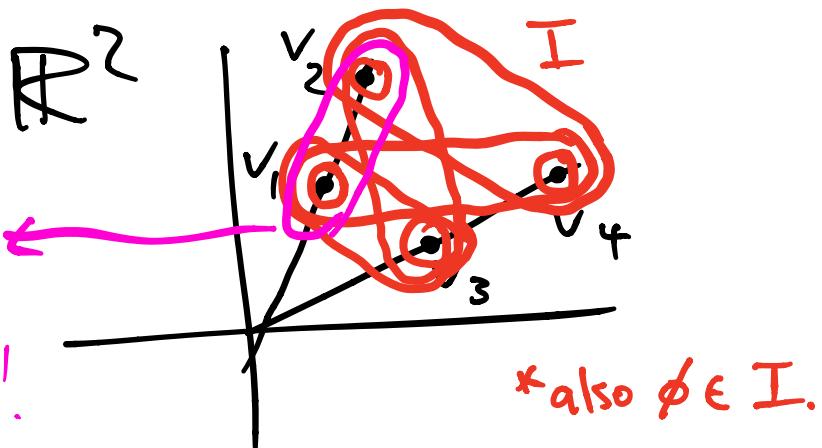
E.g. Given vectors $v_1, \dots, v_m \in \mathbb{R}^n$,
consider set system $I \subseteq 2^{[m]}$:

$$I = \left\{ S \subseteq [m] : \{v_i : i \in S\} \text{ linearly independent} \right\}$$

picture:

Not
in I !

"dependent".



Properties of I :

(P1) "Downward closed"

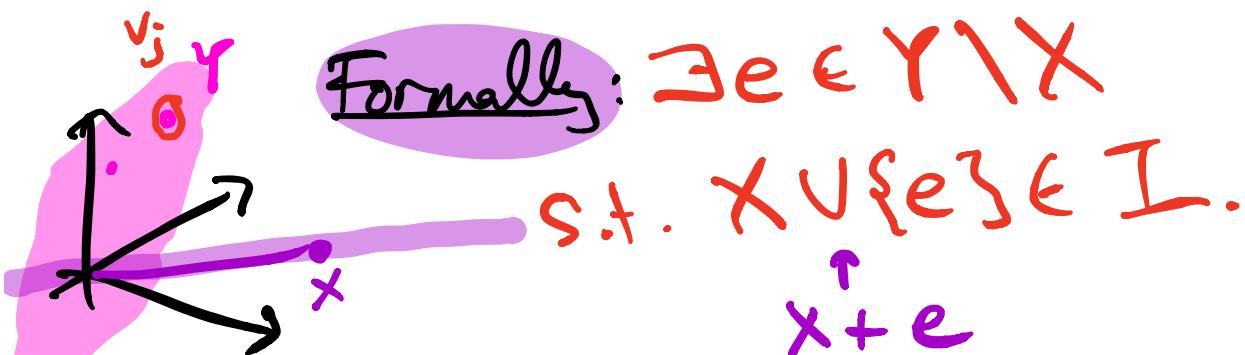
If $X \subseteq Y$, $Y \in I$, then
 $X \in I$.

(P2) "Exchange property"

If $X \in I$ and $Y \in I$ and

$$|Y| > |X|,$$

then \exists elt. in Y you can add
to X while maintaining indep. of X .



Pf of P2: $|X| = \dim \text{span}\{v_i : i \in X\}$

$$|Y| = \dim \text{span}\{v_i : i \in Y\}.$$

$$\Rightarrow \text{span}\{v_i : i \in X\} \supseteq \text{span}\{v_i : i \in Y\}.$$

$$\Rightarrow \exists j \in Y \text{ s.t. } v_j \notin \text{span}\{v_i : i \in X\}.$$

$$\Rightarrow X + j \in I.$$

□

P1, P2 capture combinatorial
structure of I.

for matroids: take P1, P2
as axioms.
 $I \subseteq 2^E$, X is maximal in I
if $\exists Y \in I$ s.t. $X \subseteq Y$.

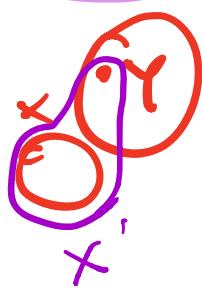
Def (Matroid) A matroid M is

a pair (E, I) where

- $E = E(M)$ finite set called ground set of M .
- $I = I(M) \subseteq 2^E$ called independent sets.

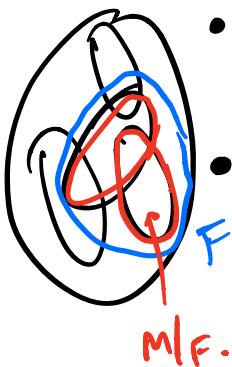
- I satisfies P1 & P2 - ^{maximum} _X

Remarks • P2 \Rightarrow all maximal ^(by inclusion).



index sets have same size.
(else could increase by P2).

- maximal independent set called a base of M.



- dependent := not independent
- for $F \subseteq E$, the restriction $M|_F$
 $M|_F = \{S \in I : S \subseteq F\}$ is another matroid.

Examples

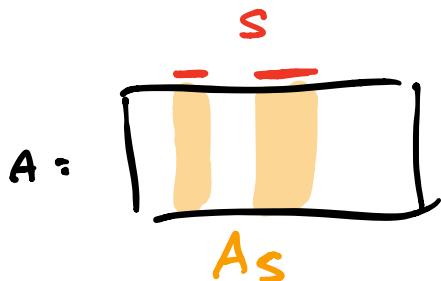
AKA "representable"
↗

- Linear matroid: example from beginning.

▷ equiv def: $A \in \mathbb{R}^{n \times m}$ matrix,

$I = \{ \text{subsets of cols. of } A$
 s.t. submatrix A_S
 has rank $\text{rank } A_S = |S| \}$. $|S|=m$
 $E = \{\text{set of columns of } A\}$.

e.g.



write $M = MA$
 if M comes
 from A .

- ▷ This makes sense for $A \in F^{n \times m}$ for any field F .
- ▷ bases of M_A : subset S s.t.
 cols. of A_S are a basis for \mathbb{R}^n .

- "boring" example:
uniform matroid: $U_{n,k} = (E, I)$
 where $|E| = n$

$U_{n,2}$
 complete
 graph on n nodes
 $I = \{ \text{all subsets of } E \text{ of size } \leq k \}$
 $= \{ S \subseteq E : |S| \leq k \}$.

i vertices.

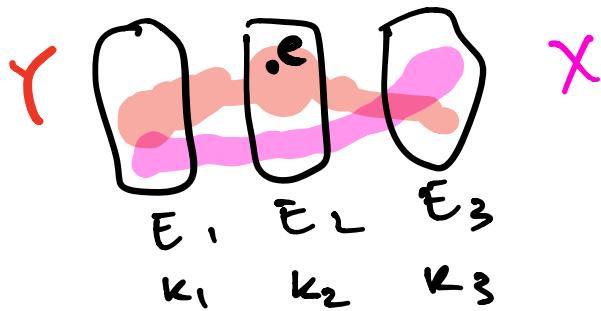
the free matroid is $U_{n,n} = 2^E$.

- partition matroid: $M = (E, I)$
where E is disjt. union $E_1 \cup \dots \cup E_k$

$$I = \{X \subseteq E : |X \cap E_i| \leq k_i\}$$

for fixed k_1, \dots, k_r (parameters).

e.g.

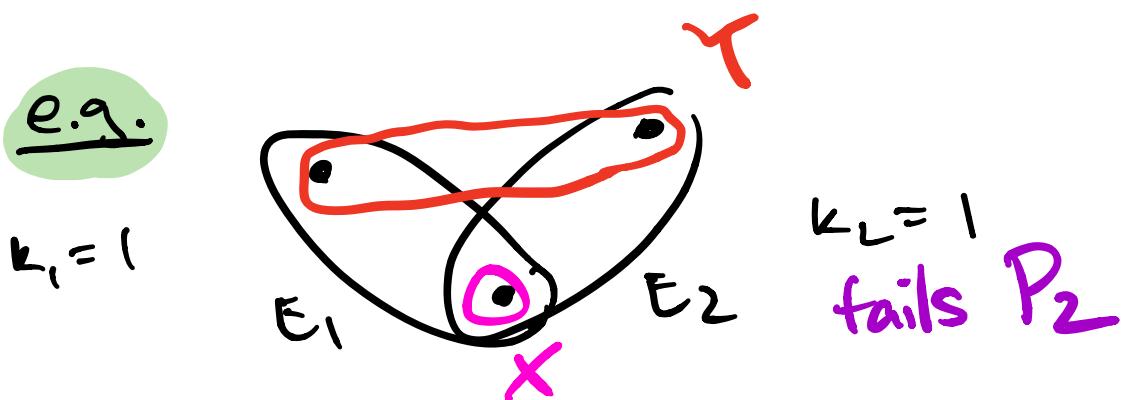


Check P2:

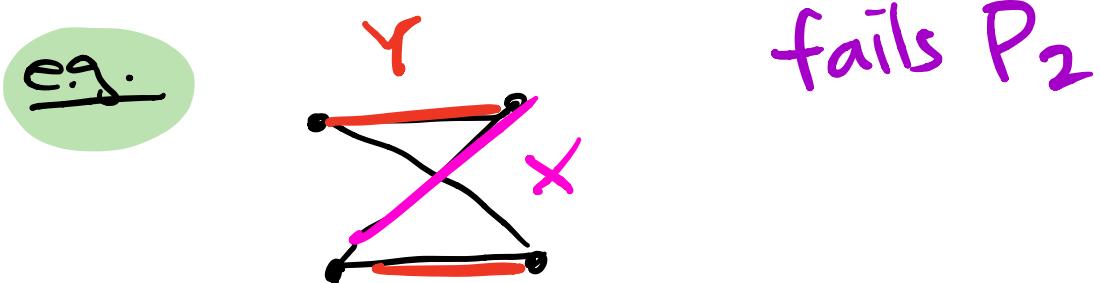
- Let $|X| < |Y|$, $X, Y \in I$.
- $\exists i \text{ s.t. } |Y \cap E_i| > |X \cap E_i|$
 $k_i \geq$

- \Rightarrow for any $e \in Y \cap E_i \setminus X \cap E_i$
 $x+e$ independent.

Remark: if E_i not disjoint:



- Another Nonesample: set of matchings in a graph.



- # graphic matroids

Given graph $G = (V, E)$, undirected

Let $M(G) = (E, I)$ where

$$I = \{ \text{forests in } G \} \\ = \{ \text{acyclic subgraphs of } G \}.$$

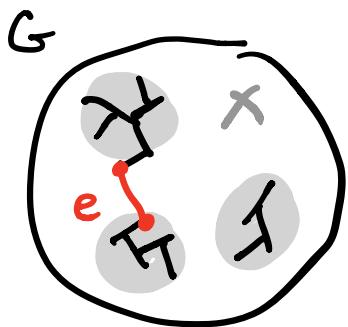
e.g.

$$G =$$


$$I = \left\{ \begin{array}{c} \text{Diagram 1}, \\ \vdots, \\ \text{Diagram 2}, \\ \dots, \\ \text{Diagram 3}, \\ \vdots, \\ \text{Diagram 4} \end{array} \right\}$$

Checking P2:

- F forest $\Rightarrow |v| - |F| = \# \text{ edges}$ \uparrow $\# \text{ connected components}$ \uparrow C.C.'s
 - X, Y forests, $|X| < |Y| \Rightarrow Y$ has fewer C.C.'s.
- \Rightarrow some edge e of Y connects two C.C.'s of X

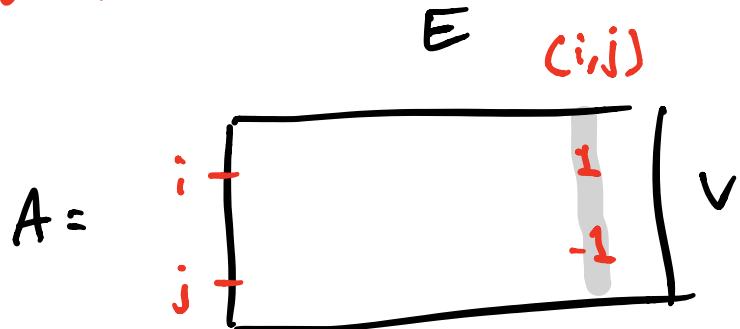


$\Rightarrow X + e$ larger forest.

▷ bases: the spanning trees.
(all have $n-1$ edges).

▷ graphic \Rightarrow linear:

P.F.: $M(G) = M_A$ where A directed
 vertex-edge incidence matrix
 (direct arbitrarily).



Ex. Check: subset of cols. is lin. indep
 \Leftrightarrow subgraph contains no cycle. \square

▷ Graphic \Rightarrow regular:

Say M regular if M is linear over every field F .

-1 in $A \Leftarrow$ additive inverse of 1 in F .

Note: A above is T.U.

Fact: matroid M regular \Leftrightarrow
 $M = M_A$ (over \mathbb{R}) for T.U. matrix A .

Circuits

by inclusion.



- Circuit: = minimal dependent set.
(i.e. $\{ \text{circuit} \} \Rightarrow C - e$ independent).

e.g. ▷ in graphic matroid: circuits are the cycles.

▷ in partition matroid, circuits are just subsets $C \subseteq E_i$ with $|C| = k+1$.

e.g.



Note:

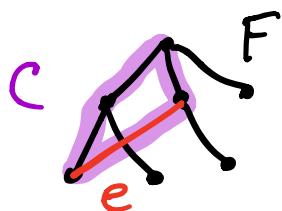
$\{ \text{circuit} \} \Rightarrow C - e$ independent

There's exactly one way to do the reverse:

Theorem (unique circuit property)

- ▷ Let $M = (E, I)$ matroid.
- ▷ Let $S \in I$, $e \in E$ s.t. $S + e \notin I$
- ▷ Then: \exists a unique circuit
 $C \subset S + e$.

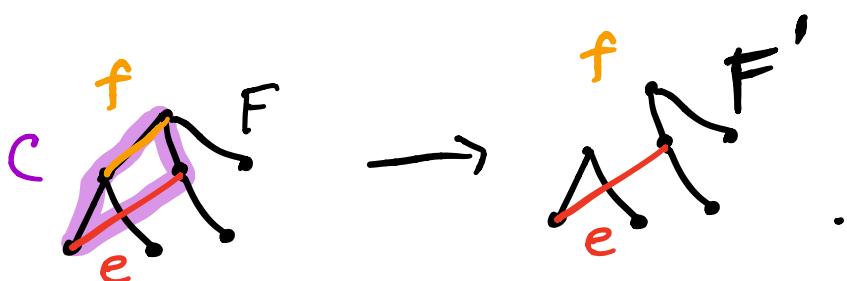
e.g. If F is a forest, $F + e$ isn't:



Remark: uniqueness shows

how to make more independent sets: Let $C \subseteq S+e$ circuit, $f \in C \setminus e$
 then $S+e-f \in \mathcal{I}$.

e.g.



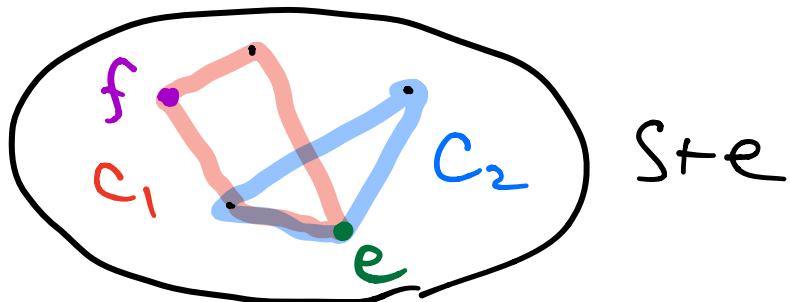
Pf: Else, $S+e-f$ contains circuit $C' \neq C$
 i.e. (and hence $S+e$).

Proof of UCP:

- suppose $S+e$ contains distinct circuits $C_1 \neq C_2$. was typo in class.
- Minimality $\Rightarrow C_1, C_2 \not\subseteq S+e-f \Rightarrow \exists f \in C_1 \setminus C_2$

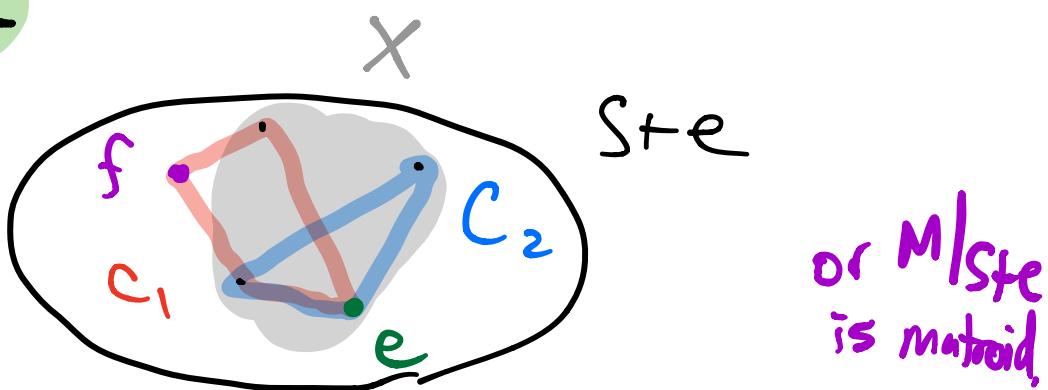
Note: $C_2 \subseteq S+e-f$.

► We'll show $\text{Ste}-f \in I$;
 contradicts $C_2 \subseteq \text{Ste}-f$. *(bc C_2 dependent,
 P1).*



- C_1-f independent $\Rightarrow C_1-f$ to
 (by minimality) maximal indep. \times
 Subject to $X \subseteq \text{Ste}$.

e.g.



or M/Ste
 is matroid,

- Both S, X maximal independent
 within $\text{Ste} \Rightarrow |X| = |S|$ by P2.

- $e \in X \Rightarrow$ because $e \in C, -f \subseteq X$
 $\Rightarrow X = S + e - f.$
- $\Rightarrow S + e - f$ indep, contradiction. \square

$M = (E, I)$ e.g. could have $E = \text{edges of } G$
 $I = \text{forests in } G$.
 (review P1, P2 from earlier).

Matroid optimization

- Given cost function $c: E \rightarrow \mathbb{R}$, want indep. set S of max. cost

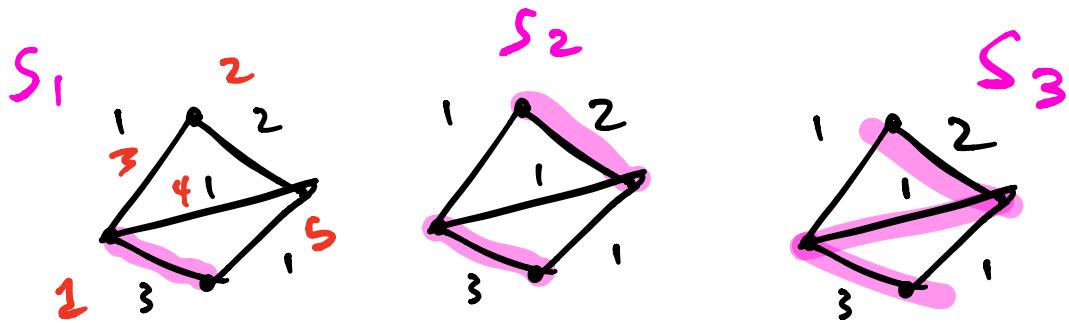
$$c(S) = \sum_{e \in S} c(e).$$

- This problem is tractable, one reason matroids are important.

- if some $c(e) < 0$: can restrict to $M|_{E-e}$. (removing from $S \in I$ increases cost).
- if $c \geq 0$: need only optimize over bases.

e.g. for graphic matroids:
on connected graphs
this is the maximum spanning tree problem (MST).

Recall: M.S.T. has simple greedy algorithm: keep adding largest element that doesn't create a cycle.



Kruskal's algorithm

- Fact: greedy alg works for any matroid.
- Actually, for all K : greedy outputs indep set of size K of max cost. S_K

Algorithm Let $|E| = n$.

- ▷ Sort E by cost: $c(e_1) \geq c(e_2) \dots \geq c(e_n)$
- ▷ $S_0 := \emptyset, K=0$

- ▷ For $j=1$ to m :
- ▷ if $S_k + e_j \in I$ then:
 - ▷ $S_{k+1} := S_k + e_j$
 - ▷ $k \leftarrow k + 1$.
- ▷ Output S_1, \dots, S_k .

Thm: For any matroid $M = (E, I)$,
 above alg. finds indep. set S_k
 such that

$$c(S_k) = \max_{\substack{|S|=k \\ S \in I}} c(S).$$

Proof : Suppose not.

- Let $S_k = \{s_1, \dots, s_k\}$ with
 $c(s_1) \geq \dots \geq c(s_k)$.
- Suppose $T_k = \{t_1, \dots, t_k\}$
 $c(t_1) \geq c(t_2) \dots \geq c(t_k)$
s.t. $c(T_k) > c(S_k)$.
- Let $p :=$ first index where
 $c(t_p) > c(s_p)$.
- Let $A = \{t_1, \dots, t_p\}$
 $B = S_{p-1} = \{s_1, \dots, s_{p-1}\}$.

- $|A| > |B| \Rightarrow \exists t_i \in A \setminus B$ s.t.
 $t_i + t_j \in I$ (by P2).
- But $c(t_i) \geq c(t_p) > c(\Delta_p)$
 $\Rightarrow c(t_i) > c(\Delta_p)$
 $\Rightarrow t_i$ should have been
 added to S_{p-1} , instead of
 S_p . ~~**~~.

□.

To get global
~~max~~
~~min-cost independent set:~~

In greedy alg,

Replace for $j = 1 \dots m$

$b_j \quad j = 1, \dots, q$

~~e_q~~ e_q is last
nonnegative element.